



**AFRL-AFOSR-VA-TR-2016-0161**

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## GEO Satellites as Space Weather Sensors

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**04/26/2016**  
**Final Report**

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Air Force Research Laboratory  
AF Office Of Scientific Research (AFOSR)/RTB1

Arlington, Virginia 22203  
Air Force Materiel Command

<b>REPORT DOCUMENTATION PAGE</b>				<i>Form Approved</i> OMB No. 0704-0188	
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<b>1. REPORT DATE (DD-MM-YYYY)</b> 04/12/2016		<b>2. REPORT TYPE</b> Final Report		<b>3. DATES COVERED (From - To)</b> 02/15/2013-02/14/2016	
<b>4. TITLE AND SUBTITLE</b> GEO SATELLITES AS SPACE WEATHER SENSORS				<b>5a. CONTRACT NUMBER</b>	
				<b>5b. GRANT NUMBER</b> FA9550-13-1-0099	
				<b>5c. PROGRAM ELEMENT NUMBER</b>	
<b>6. AUTHOR(S)</b> Cahoy, Kerri Carlton, Ashley				<b>5d. PROJECT NUMBER</b>	
				<b>5e. TASK NUMBER</b>	
				<b>5f. WORK UNIT NUMBER</b>	
<b>7. PERFORMING ORGANIZATION NAME(S) AND ADDRESS(ES)</b> Massachusetts Institute of Technology 77 Massachusetts Avenue Cambridge, MA 02139				<b>8. PERFORMING ORGANIZATION REPORT NUMBER</b>	
<b>9. SPONSORING/MONITORING AGENCY NAME(S) AND ADDRESS(ES)</b> AF Office of Scientific Research 875 North Randolph Street, RM 3112 Arlington, VA 22203				<b>10. SPONSOR/MONITOR'S ACRONYM(S)</b> AFOSR	
				<b>11. SPONSOR/MONITOR'S REPORT NUMBER(S)</b>	
<b>12. DISTRIBUTION/AVAILABILITY STATEMENT</b> Approved for public release; distribution is unlimited.					
<b>13. SUPPLEMENTARY NOTES</b>					
<b>14. ABSTRACT</b> We have acquired and analyzed >1 million hours of geostationary communications satellite housekeeping telemetry from commercial operators and have correlated the data with space weather observations and models. We analyzed two component types: solar cells and high power amplifiers. For amplifiers, we identified the occurrence of anomalies is not random with respect to the space weather environment. There appears is relationship to high-energy electron fluence between 10 - 21 days before the anomalies. From simulation and electron beam lab tests, we demonstrated that a potential cause may be internal charging which occurs in the amplifier chain. We also calculated on-orbit degradation of both Si and GaAs solar cells and quantified the degradation of the cells during severe solar proton events of 10 MeV protons. We compared the data with several combinations of space weather environment solar cell degradation models; predicted performance is within 1% of the observed degradation. We developed algorithms that find any unusual behavior in satellite health telemetry without requiring training data. Once identified, we collect and analyze them, along with assessing space weather observations and operational environment factors, and rank them by their their importance.					
<b>15. SUBJECT TERMS</b> geostationary, satellite, communications, power amplifiers, space weather, anomalies, fault detection, solar cells, telemetry					
<b>16. SECURITY CLASSIFICATION OF:</b>			<b>17. LIMITATION OF ABSTRACT</b>	<b>18. NUMBER OF PAGES</b>	<b>19a. NAME OF RESPONSIBLE PERSON</b> Kerri Cahoy
a. REPORT	b. ABSTRACT	c. THIS PAGE			<b>19b. TELEPHONE NUMBER (Include area code)</b> 617-324-6005

## INSTRUCTIONS FOR COMPLETING SF 298

**1. REPORT DATE.** Full publication date, including day, month, if available. Must cite at least the year and be Year 2000 compliant, e.g. 30-06-1998; xx-06-1998; xx-xx-1998.

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**4. TITLE.** Enter title and subtitle with volume number and part number, if applicable. On classified documents, enter the title classification in parentheses.

**5a. CONTRACT NUMBER.** Enter all contract numbers as they appear in the report, e.g. F33615-86-C-5169.

**5b. GRANT NUMBER.** Enter all grant numbers as they appear in the report, e.g. AFOSR-82-1234.

**5c. PROGRAM ELEMENT NUMBER.** Enter all program element numbers as they appear in the report, e.g. 61101A.

**5d. PROJECT NUMBER.** Enter all project numbers as they appear in the report, e.g. 1F665702D1257; ILIR.

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**5f. WORK UNIT NUMBER.** Enter all work unit numbers as they appear in the report, e.g. 001; AFAPL30480105.

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**7. PERFORMING ORGANIZATION NAME(S) AND ADDRESS(ES).** Self-explanatory.

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**14. ABSTRACT.** A brief (approximately 200 words) factual summary of the most significant information.

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GEO Satellites as Space Weather Sensors  
AFOSR Grant FA9550-13-1-0099  
PI: Dr. Kerri Cahoy

We have acquired and analyzed >1 million hours of geostationary communications satellite housekeeping telemetry from commercial operators and have correlated the data with space weather observations and models. Our analysis focused on two component types: solar cells and high power amplifiers. We have calculated on-orbit degradation of both Si and GaAs solar cells and quantified the degradation of the cells during severe solar proton events of 10 MeV protons [Lohmeyer, et al, 2016]. We used the calculated degradation to evaluate several combinations of space weather environment models with solar cell degradation models and found that predicted performance is within 1% of the observed degradation. These models had not previously been validated using multiple on-orbit GEO datasets.

For high power amplifiers, we conducted a root-cause analysis of solid state power amplifier (SSPA) anomalies on-board eight GEO satellites [Lohmeyer and Cahoy, 2013; Lohmeyer, et al., 2015]. From the statistical analysis, we identified that the occurrence of anomalies was not random with respect to the space weather environment, but that there appeared to be a relationship to high-energy electron fluence for periods of time between 10 - 21 days before the anomalies. From the simulations and electron beam lab tests, we demonstrated that internal charging occurs in the amplifier chain, potentially identifying a cause for the observed anomalies.

In addition to analyzing specific component telemetry, we have developed algorithms that find any unusual behavior in satellite health telemetry [Carlton, et al., 2015; Carlton and Cahoy, 2015]. Once these events have been identified, we collect and analyze them, along with assessing space weather observations and operational environment factors. Our approach statistically evaluates the telemetry stream compared to a local norm. This approach allows us to apply our algorithms to any spacecraft platform, since there is no reliance on satellite- or component-specific parameters, and it does not require *a priori* knowledge about the data distribution. We apply these techniques to individual telemetry data streams on a GEO ComSat and compile a list of unusual events for each satellite. Preliminary results include being able to identify events that affect many telemetry streams at once, indicative of a system-level event. With data from multiple satellites, we use these methods to better identify external factors. We compare event dates to known operational activities and to known space weather events. Future work includes identification of probabilistic relationships between event dates and known operational and space weather events and a component sensitivity analysis to events in an effort to validate the use of event detection algorithms for spacecraft monitoring and for environmental sensing.

We will expand upon current event detection algorithms in the areas of moving the algorithm online and incorporating learning from previous mission data. We intend to submit a white paper to AFRL on the algorithms for GEO ComSats in the interest of continued collaboration with AFRL. This effort will be augmented by support from the NASA Space Technology Research Fellowship awarded to A. Carlton (beginning in the fall of 2016).

Lohmeyer, W., R. Aniceto, A. Carlton, and K. Cahoy, "Solar Array Degradation on Geostationary Communications Satellites: The Quantification of Annual Degradation and Degradation over Solar Proton Events," submitted for publication in the Journal of Solar Energy, Jan. 2016.

Lohmeyer, W. and K. Cahoy, "Space Weather Radiation Effects on Geostationary Satellite Solid-State Power Amplifiers," Space Weather, Vol. 11, 2013, pp. 476-488.

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Carlton, A., W. Lohmeyer, and K. Cahoy, "GEO Comm. Satellites as Sensors for the Space Environment: Telemetry Event Identification Algorithms," AIAA Improving Space Operations Workshop SOSTC, Pasadena, CA, 05 May, 2015.

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*Auxiliary information and response to our inquiry on format of report.*

*Dear Kerri Cahoy,*

*Our records at AFOSR indicate that your Grant FA9550-13-1-0099, "GEO Satellites as Space Weather Sensors," is nearing its end and will be closing on 14 FEBRUARY 2016.*

*As of 15 January 2016, AFOSR will no longer accept any modification requests and will begin the Grant close-out process.*

*We encourage you to begin preparing your Final Performance Report and SF 298 form, which are due within 90 days of the end of your Grant.*

*Details about submitting your Final Performance Report can be found on the AFOSR website:  
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*Be sure to coordinate with your Program Officer regarding their expectations of your Final Performance Report content.*

*Regards,*

*The AFOSR Business Team*

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*Email from Julie Moses:*

*All we need for the closeout/final report is an abstract-length (250 words) summary of the accomplishments of the research.*

1.

**1. Report Type**

Final Report

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kcahoy@mit.edu

**Primary Contact Phone Number**

Contact phone number if there is a problem with the report

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**Organization / Institution name**

MIT

**Grant/Contract Title**

The full title of the funded effort.

GEO SATELLITES AS SPACE WEATHER SENSORS

**Grant/Contract Number**

AFOSR assigned control number. It must begin with "FA9550" or "F49620" or "FA2386".

FA9550-13-1-0099

**Principal Investigator Name**

The full name of the principal investigator on the grant or contract.

Kerri Cahoy

**Program Manager**

The AFOSR Program Manager currently assigned to the award

Julie Moses, Kent Miller

**Reporting Period Start Date**

02/15/2013

**Reporting Period End Date**

02/14/2016

**Abstract**

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AFOSR Grant FA9550-13-1-0099

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**Archival Publications (published) during reporting period:**

Lohmeyer, W., R. Aniceto, A. Carlton, and K. Cahoy, "Solar Array Degradation on Geostationary Communications Satellites: The Quantification of Annual Degradation and Degradation over Solar Proton Events," submitted for publication in the Journal of Solar Energy, Jan. 2016.

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**Changes in research objectives (if any):**

None

**Change in AFOSR Program Manager, if any:**

**Extensions granted or milestones slipped, if any:**

None

**AFOSR LRIR Number**

**LRIR Title**

**Reporting Period**

**Laboratory Task Manager**

**Program Officer**

**Research Objectives**

**Technical Summary**

**Funding Summary by Cost Category (by FY, \$K)**

	Starting FY	FY+1	FY+2
Salary			
Equipment/Facilities			
Supplies			
Total			

**Report Document**

**Report Document - Text Analysis**

**Report Document - Text Analysis**

**Appendix Documents**

**2. Thank You**

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